



# Reputations and Games

#### Sampath Kannan

Department of Computer and Information Science
University of Pennsylvania
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#### Reputation – A game-theoretic view

- Need repeated (pair-wise) interactions between agents = repeated games
- What does an agent do in a game?
   She plays a (mixed) strategy ... which may change over time, depending on opponent, etc.
- Her "reputation" should be a function of this timevarying mixed strategy.





# Repeated vs One-Shot Game: Example

Prisoner's Dilemma

|           | Defect | Cooperate |
|-----------|--------|-----------|
| Defect    | -6     | -1        |
| Cooperate | -9     | -2        |

Payoffs to row player; Symmetrically to column player

- Game-theorists talk about "type" of player defecting type or cooperating type
- Reputation: inferred type of a player based on repeated observation





### To study value of reputation manager...

- Consider a 2-player game:
- Assume player Alice plays Bob repeatedly
- New twist: A does not know the payoff matrix
- Instead she must balance exploration and exploitation to minimize regret
- Exploration: A seeks to learn new matrix entries
- Exploitation: A seeks to profit from known entries
- Regret: A's lost payoff compared to the situation where she knows the matrix to start with





# If A knew B's type ...

- In zero-sum games she can identify her optimal strategies and learn payoffs for them with very little regret - O(n) regret where n is the number of strategies available to her. (This is best possible!)
- If instead she doesn't know B's type, best we can do currently is O(n²) regret. Probably can't be beaten in general.
- Thus in this model, a reputation manager makes a big difference!





### More ways RMs can help

- Use player's behavior to estimate distribution of their types and their utilities for various outcomes
- If we assume a Bayesian prior on types, then we can design mechanisms [Z. Huang and Bei] that
  - Cause players to tell the truth about their types
  - Produce approximately optimal social welfare in some important resource allocation problems
- Reputation managers can give us these Bayesian priors





# More on Zhiyi-Bei result

- Mechanism design in Bayesian model for many optimization problems:
  - Combinatorial resource allocation
  - Submodular maximization
- These problems are known to be difficult to solve even approximately in worst-case model
- But in the Bayesian model (realized by having a reputation manager) there are good approximate solutions





#### **Future Work**

- Explore other possible definitions of reputation in the game-theoretic context
  - Altruism: Each player has an altruism parameter
     a that corresponds to their reputation
  - Player gets payoff which is their own + a\*(everybody else's)
  - Player's reputation is a and must be discovered
- In games with multiple equilibria: reputation is a way of describing which equilibrium a player prefers.





#### Conclusions

- Game-theoretic frameworks can be used in two stages of our Trust Management infrastructure:
  - Defining and computing reputations
  - Making decisions based on these reputations
- While problems are still challenging, intractable problems assuming a worst-case adversary, could become tractable in this game-theoretic setting
- To use this idea one needs a more complete set of models for adversaries seeking to optimize their own objective functions